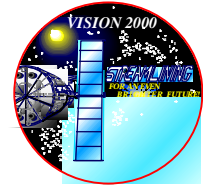




**APPLICATIONS OF WAREHOUSING AND DATA MINING  
SPECIAL EXECUTIVE CONFERENCE: Trends And  
Technologies For Knowledge Management**



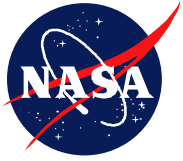
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# **The Hubble Space Telescope Engineering Data Warehouse**

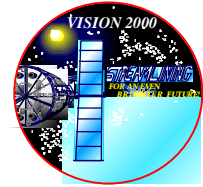


**Presented By: Ken Lehtonen  
NASA/Goddard**

April 20-21, 1998



# APPLICATIONS OF WAREHOUSING AND DATA MINING

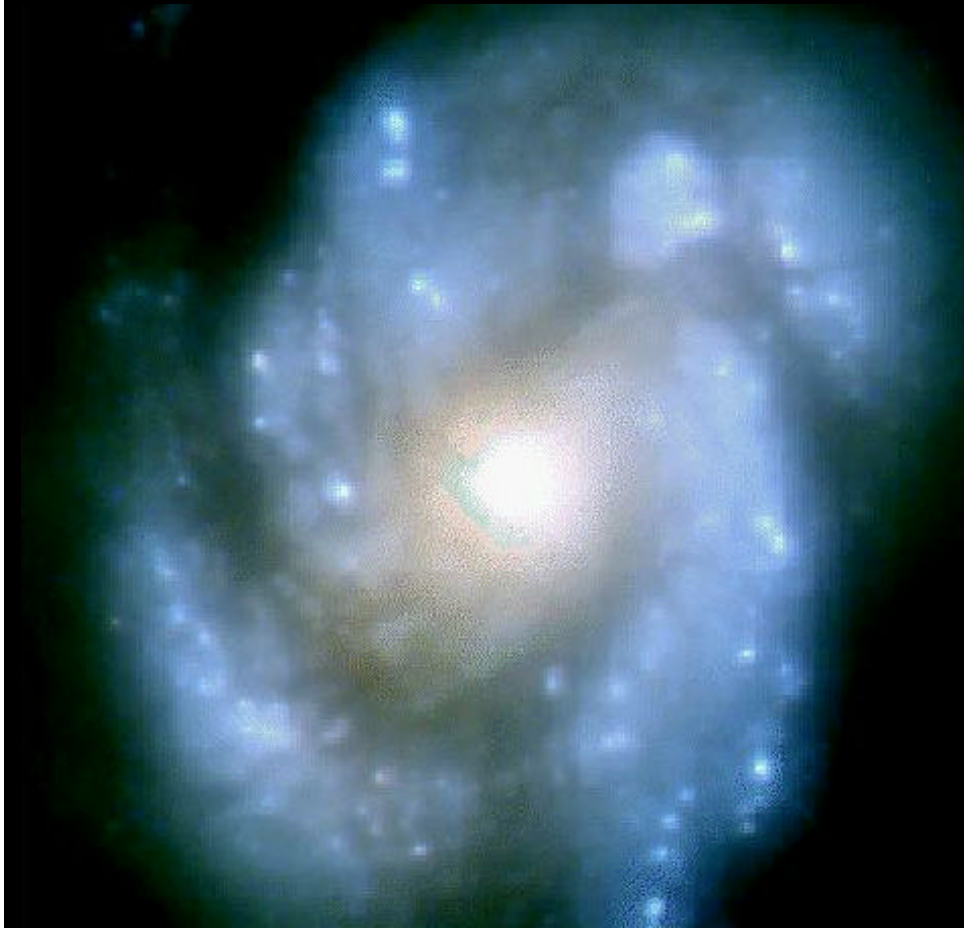


## Agenda

- u Introduction: “Quick Tour” of Hubble’s Universe
- u Overview of HST Reengineering Project
- u Application of Data Warehouse Technology
- u Progress To Date
- u Remaining Challenges
- u Lessons Learned
- u For More Information

# Comparison before and after HST Servicing Mission 1

## M100 Galactic Nucleus



Wide Field Planetary Camera 1



Wide Field Planetary Camera 2

**You are here**



**We are here**



# Starbirth Region in M33 Nebula, NGC604



CFHT

Mt. Polomar Observatory

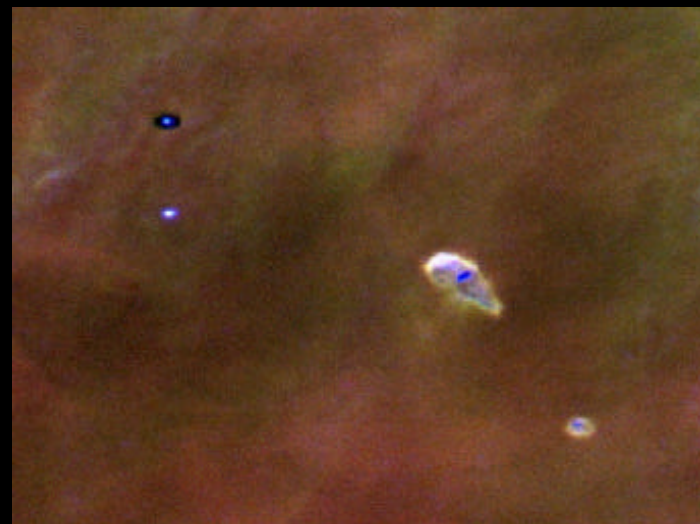


HST

STScI-PRC96-27



# The Orion Nebula



Doug Johnstone - CITA



STScI-PRC95-45a

STScI-PRC95-45b

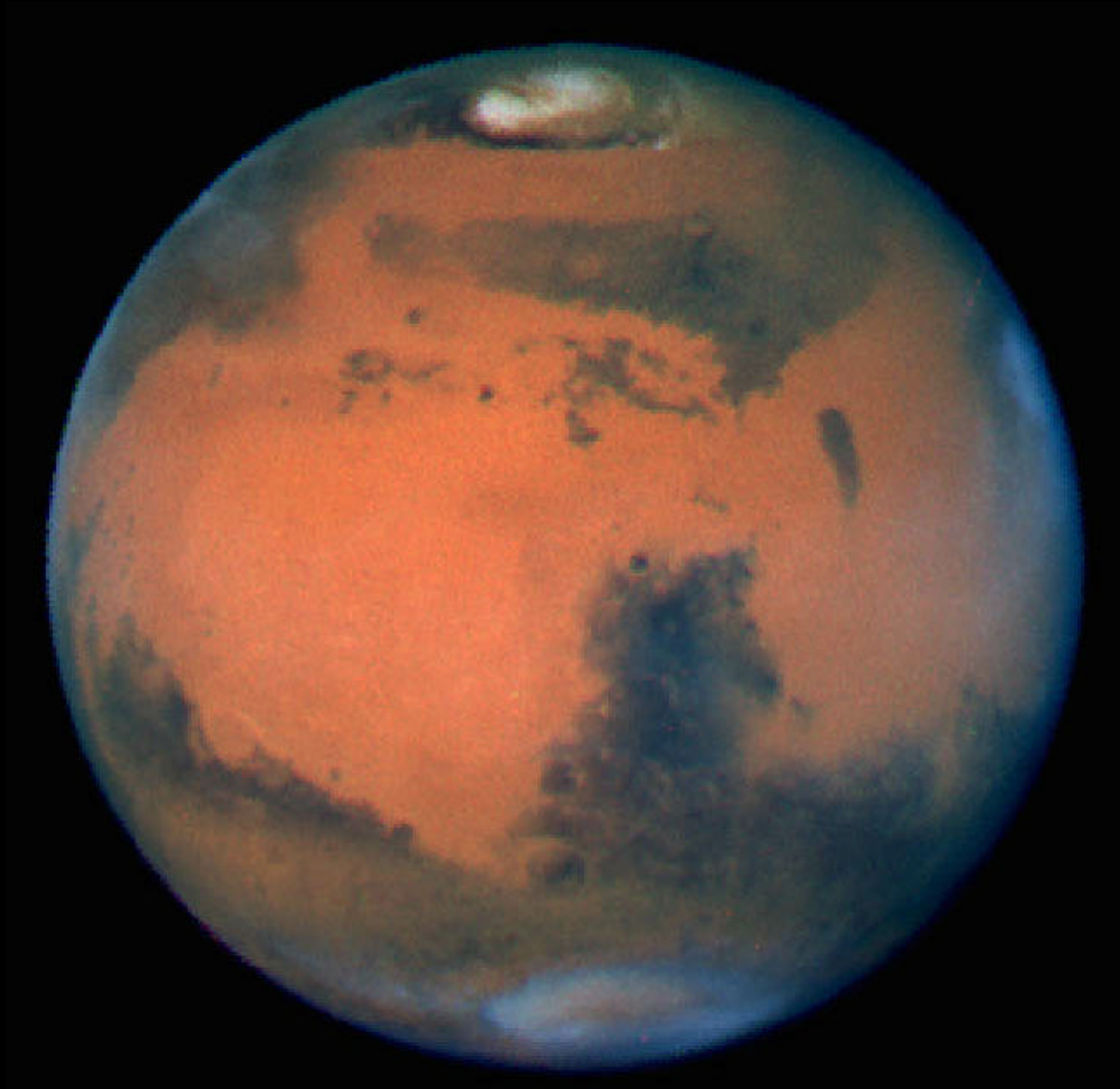
# HST Young Galaxy Survey



*STScI-PRC96-29a*



# *Mars*



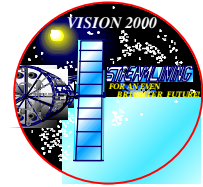
STScI-PRC97-09a



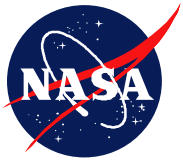


## APPLICATIONS OF WAREHOUSING AND DATA MINING

### Overview of HST Reengineering Project “Mission Statement”

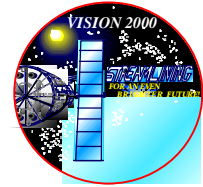


- u Re-engineer the HST operational systems to streamline and modernize HST's overall ground system operations
- u Reduce overall operations and maintenance cost of the system by at least 50% through automation of routine functions and use of off-the-shelf components
- u Provide for monitoring the ground and space systems by the system itself, involving operations personnel *on an exception basis only*
- u Provide an integrated system that replaces the functionality of currently disparate systems and data “marts”
- u Support access to engineering telemetry data necessary to perform diagnosis from anywhere in the world
- u Be a technological leader in ground systems by incorporating the latest proven technology and use, to the maximum extent practical, Commercial Off-The-Shelf (COTS) products (e.g., data warehouse)



## APPLICATIONS OF WAREHOUSING AND DATA MINING

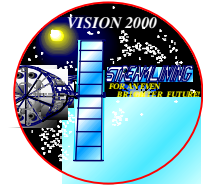
### Overview of HST Reengineering Project “The Control Center System (CCS)”



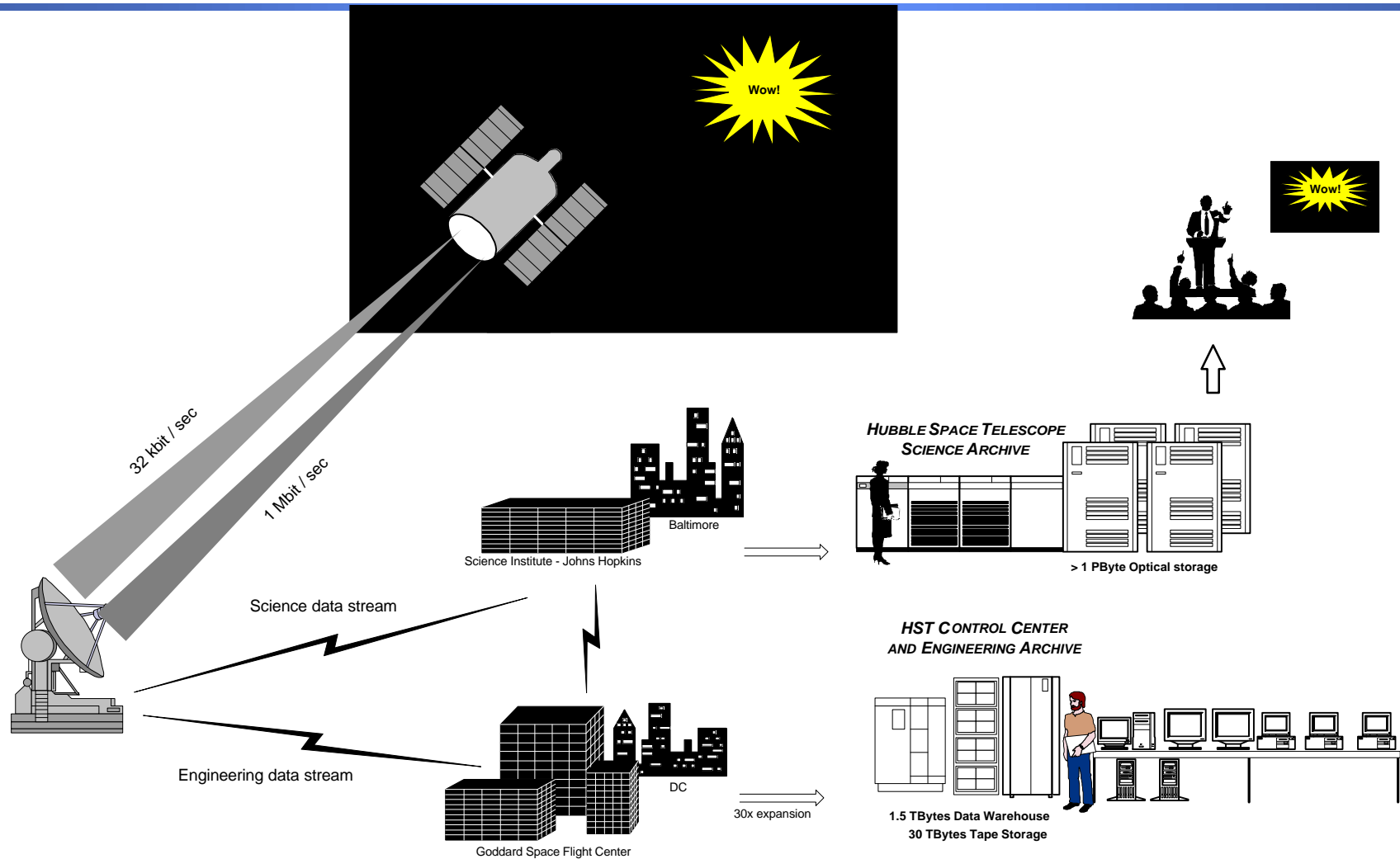
- u Commands and controls the Hubble Space Telescope
- u Processes and stores all of the *engineering* telemetry data:
  - spacecraft temperature
  - electrical power
  - attitude
  - on-board computer dumps, etc.
- u Tracks all “vital signs” of the HST in a mission-critical sense
- u Is evolving toward “lights-out” operations [or at least “dimmed”]



# APPLICATIONS OF WAREHOUSING AND DATA MINING



## Elements of the End-to-End System

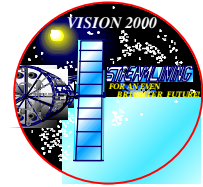




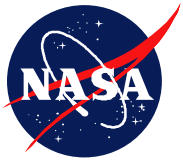


## APPLICATIONS OF WAREHOUSING AND DATA MINING

### Application of Data Warehouse Technology “Goals & Objectives”



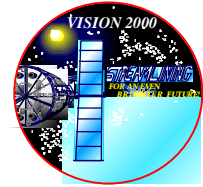
- u Centralize all of HST's multiple data stores into one data warehouse
- u Provide immediate access to all of HST's engineering telemetry data
- u Enable user to issue “canned,” customizable queries or to pose complex questions of the data using standard Structured Query Language statements or commercial tools
- u Reduce the amount of time to analyze/predict anomalies with the HST spacecraft subsystems
- u Provide access to engineering telemetry for a spacecraft with:
  - Full-time, 24x7 operations
  - A mission life expectancy to year 2010 (with two more servicing missions scheduled)



# APPLICATIONS OF WAREHOUSING AND DATA MINING

## Application of Data Warehouse Technology

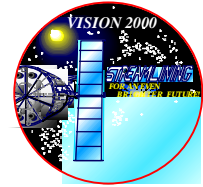
### “Early Work”



- u Conducted product searches; downloaded demo software; and, contacted prospective vendors
- u Evaluated several data warehouse products and conducted performance benchmarks on each: *benchmarking was critical*
- u Selected **Red Brick Systems** and initiated a small pilot phase with the Space Telescope Science Institute
  - Retained the services of a Red Brick consultant to assist in the design of the schema and to work issues with Corporate
  - Held several vendor training classes for the team including DBAs
- u Incorporated results of pilot phase into the overall architecture and design of the CCS for a future delivery. Pilot phase looked at DW structure and compared:
  - segmentation by time (months/years) vs.
  - segmentation by mnemonic



# APPLICATIONS OF WAREHOUSING AND DATA MINING

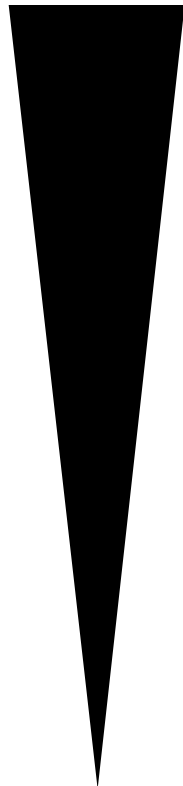


## The Analysis Spectrum

*General*

*Data Warehouse*

*Discrete State*



***Abstract Analysis***

*relational operations*

*count occurrences*

*correlate events*

***Summary Analysis***

*long-term trends*

*averages*

***Detailed Analysis***

*short periods of time*

*high granularity*

***Scientist***

***Instrument  
Engineer***

***Operations***

***Spacecraft  
Engineer***

*Specific*

*All-points flat files*

*Time Continuum*

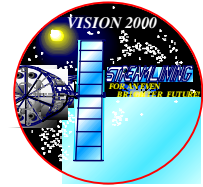




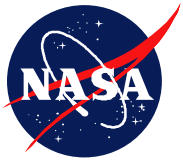
# APPLICATIONS OF WAREHOUSING AND DATA MINING

## Application of Data Warehouse Technology

### “Solving the Data Problem”



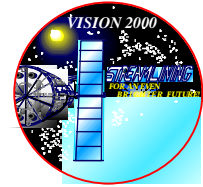
- u Problem In A Nutshell: *“In one year, HST engineering stream produces 1.5 TB in flat files or 100 billion rows in a database.”*
- u Solution: *“Implement Data Reduction techniques”*:
  - Algorithmic Data Reduction: using “change-only” and statistical sampling, 100 B rows/year reduced to 1.8 B rows/year + indices and stored in the DW on high-density RAID disk drives
  - Data Compression: 1.5 TB/year compressed to 500 GB/year and stored in the flat-file archive using DLT jukebox technology
    - » *“DATA FROM LAUNCH THROUGH YESTERDAY IS ONLINE”*
- u Once the data has been cleansed and “pre-loaded”, the Red Brick Product will:
  - Load 24 hours of data in 15 minutes!!
  - Segment the data by month
  - Store the data into files based on time
  - Support fast queries via “star indices”



# APPLICATIONS OF WAREHOUSING AND DATA MINING

## Application of Data Warehouse Technology

### “A New Operations Concept”



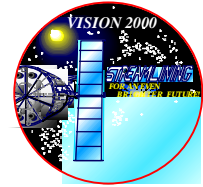
- u Data Warehouse manages aggregate data
  - is used for majority of analysis by spacecraft engineers:
    - » trends, signatures, relations, or data mining
    - » time-based analysis at low resolution, on the order of days to weeks
    - » tool to focus analysis from general to specific
- u Data Warehouse becomes index into flat files
  - flat-file requests should be very specific:
    - » time resolution from milliseconds to hours
    - » few to several data items
- u **Summary:**
  - Constructed the data warehouse for 80% of our analyses
  - Preserved 100% of our data in an archive
  - Used a common index: time (GUI or data server bridges the data sets)



# APPLICATIONS OF WAREHOUSING AND DATA MINING

## Application of Data Warehouse Technology

### “Current Schema Contents”



#### u Engineering Telemetry

- **Averaged, high rate:** Mnemonic, Start/Stop Time, Min, Max, Avg, Telemetry Format, Sample Count, Status flags
- **Change Only, low rate:** Mnemonic, Start/Stop Time, Telemetry Format, Discrete Value, EU value, Raw Value, Status flags

#### u Events

- Spacecraft and Orbital Events, planned, not actual
- Used to find/describe telemetry

#### u Metadata

- Mnemonic definitions and descriptive data (“definitions & attributes”)
- Discrete codes for “Discrete & Binary” mnemonics (“valid values”)
- Event Class descriptions and defaults

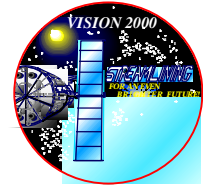
#### u Dimensions

- Date, Time, Millisecond





# APPLICATIONS OF WAREHOUSING AND DATA MINING



## Progress To Date

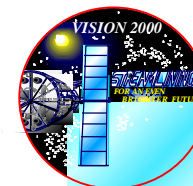
- u Schema Finalized for Telemetry
  - Simple
  - Narrow Rows: indices pointing to data
- u Finalizing Design For Other Data (separate tables)
  - Events (day/night crossings; South Atlantic Anomaly)
  - Shuttle/Servicing Mission Data
  - Derived Mnemonics
- u Installed the Red Brick Product
- u Established Data Warehouse Working Group
  - Spacecraft Engineers
  - Representatives from operations
- u Executed, via the GUI, Several Canned, Customizable Queries Against the Telemetry To Establish Performance Baseline



# APPLICATIONS OF WAREHOUSING AND DATA MINING

## Application of Data Warehouse Technology

### “Sample GUI Data Request Screen”



Colo:ccsc23a:itest::Historical Request:ACTIVE

File Tools Request Type Display Options Help

### Data Warehouse Request

**Mnemonic List**

Name	R/T
CBAT1-E	Y
CBAT1-K	Y
CBAT1-T	Y
CBAT1CAP-M	Y
CBAT1CUR	Y
CBAT1CUR-H	Y
CBAT1CUR-K	Y
CBAT1CUR-L	Y
CBAT1CUR-M	Y

Set Constraint  
Add to Dataset  
Deselect  
Remove

**Plot** | Report | Data

**Source Type**

- ☒ Change Only
- ☐ Average

**Constrain Using**

- ☒ Mnemonic
- ☐ Sampling

**Time Span Panel**

START: 1998/078/18:28:26.295  
YYYY/DDD/HH:MM:SS.mmm  
STOP: 1998/078/19:28:26.295  
NEXT

Duration: 12 Minutes  
Start=Stop-Duration  
Apply Latest DW

**Constraint Mnemonic**

CBAT1CUR-L  
LT Equal  
1234  
Chg: Raw

**Attributes**

Plot Title: Job Number 1  
1 Mnem/Page  
Mnems/Plot: 1  
Plots/Page: 1

**Data Set (Limit 200)**

Raw Black Points X

Mnemonic	Units	Color	Line	Symbol
CBAT1-E	Raw	Blue	Line	Diamond
CBAT1-K	Raw	Magenta	Points	Star
CBAT1-T	Raw	Red	Line	Star
CBAT1CAP-M	Raw	Black	Line	X

Remove Copy

**Feedback Messages**

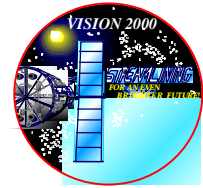
YES: Accepting output from other CCS tools.

**Time Estimate**

Twenty minutes

**Control Buttons**

Submit Close



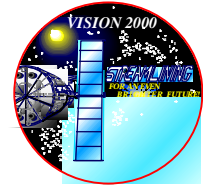
## Remaining Challenges

- u Integrate the Data Warehouse product into the CCS development cycle and perform initial checkout of integrated system: complete by April 30
- u Verify query capabilities (simple & complex) and perform associated performance testing with live users and real data
- u Deliver the system for operational support commencing August 31
  - Current data merged into 24 hour data sets then filtered and reduced using a custom preloader utility (in 2 1/2 hours)
  - Data Warehouse utility loads 5 million rows per day (in 15 minutes)
- u Begin loading eight year's worth of legacy telemetry data into warehouse commencing September 15 and completing one year later
  - Use separate system to process the legacy data (synchronize with current process)
  - Plan to load 1 TB of data in one year
- u Become experienced with the data warehouse in an operational setting



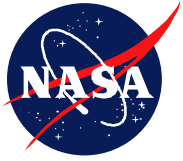


# APPLICATIONS OF WAREHOUSING AND DATA MINING



## Lessons Learned

- u Implementation requires that upfront design and requirements work be much more complete than a conventional data management project
- u Benchmarks of potential vendor products should be performed
- u A pilot project should be undertaken (“build in small steps”) and then reviewed by potential users
- u JAD sessions are useful in “setting expectations” as well as capturing real user requirements (evolutionary process)
- u Consultants (from the selected vendor) can be very helpful during the design and implementation process:
  - accelerate the design process itself (schema development)
  - are invaluable in understanding the actual data warehouse product



# APPLICATIONS OF WAREHOUSING AND DATA MINING

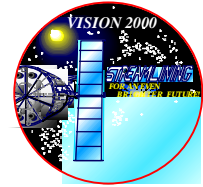
## Lessons Learned (continued)



- u The more open the architecture, the easier it is to incorporate new tools (e.g., reporting tools) as they become available
- u Important to train your own staff (“more cost effective”) as experienced DW designers and DBAs are in short supply
- u Data Warehouses are “pricey”: need unqualified support from upper management and associated commitment in terms of resources: \$\$ and people (Note: ROI often in terms of *value*.)



# APPLICATIONS OF WAREHOUSING AND DATA MINING



## For More Information

- u E-Mail: **klehtonen@v2pop.hst.nasa.gov**  
Voice: (301) 918-7412
- u Results of the Data Warehouse Pilot Study  
**[http://www.sesd.stsci.edu/ccs\\_dw/](http://www.sesd.stsci.edu/ccs_dw/)**
- u CCS URL: **<http://ccs.hst.nasa.gov>**
  - Point to “Data Management” Team
  - Scroll for “CCS Data Warehouse Pilot Study”
- u Red Brick’s URL: **<http://www.redbrick.com>**
- u DM Review’s URL: **<http://www.data-warehouse.com/>**